

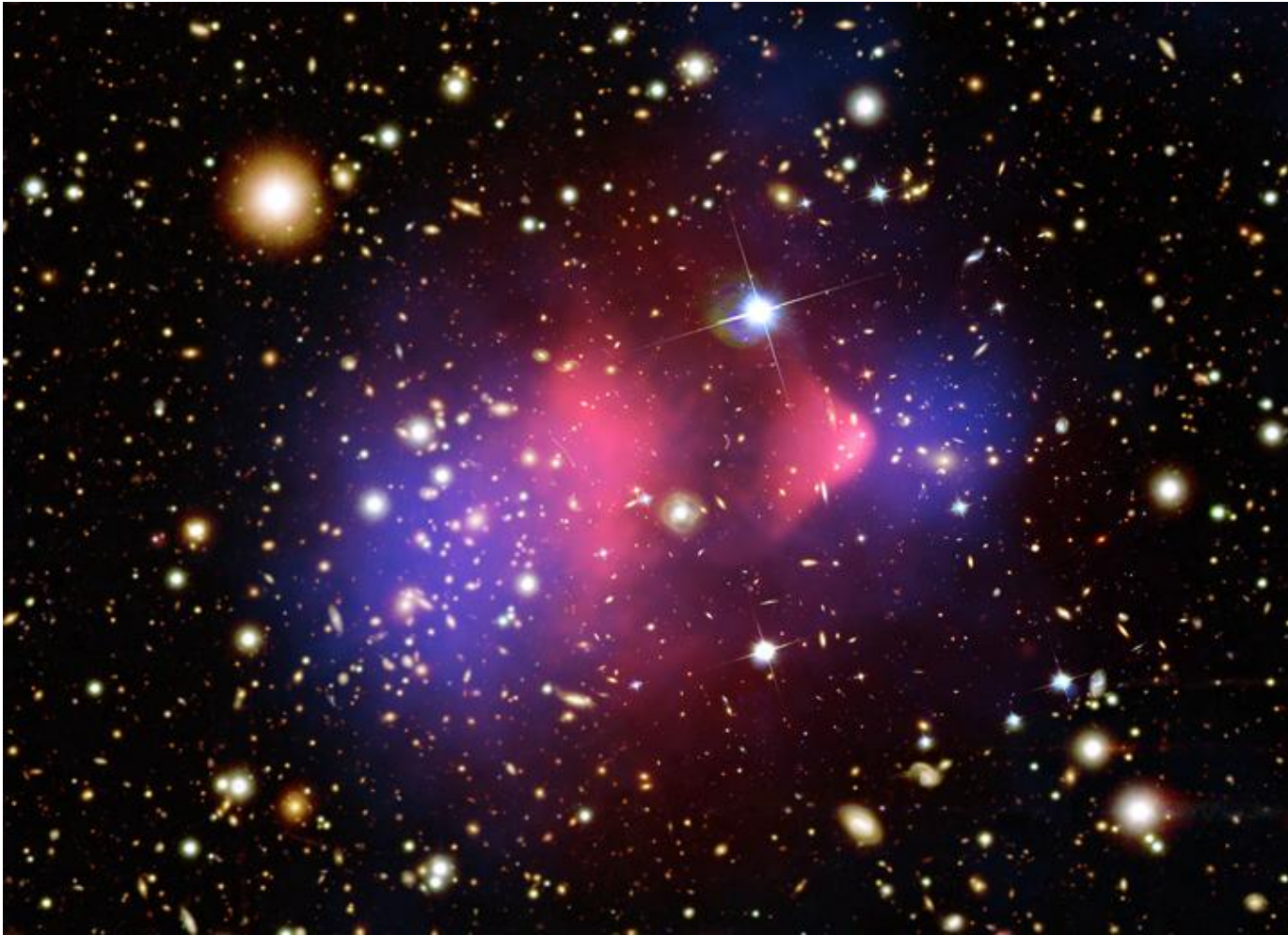
Cluster Cosmology and Projection Effects: Validating a Robust Pipeline and Application to SDSS Data

Youngsoo Park

w/ Tomomi Sunayama, Masahiro Takada, ++

IPMU Postdoc Colloquium Series, 11/26/2021

Galaxy Clusters as Cosmological Probes



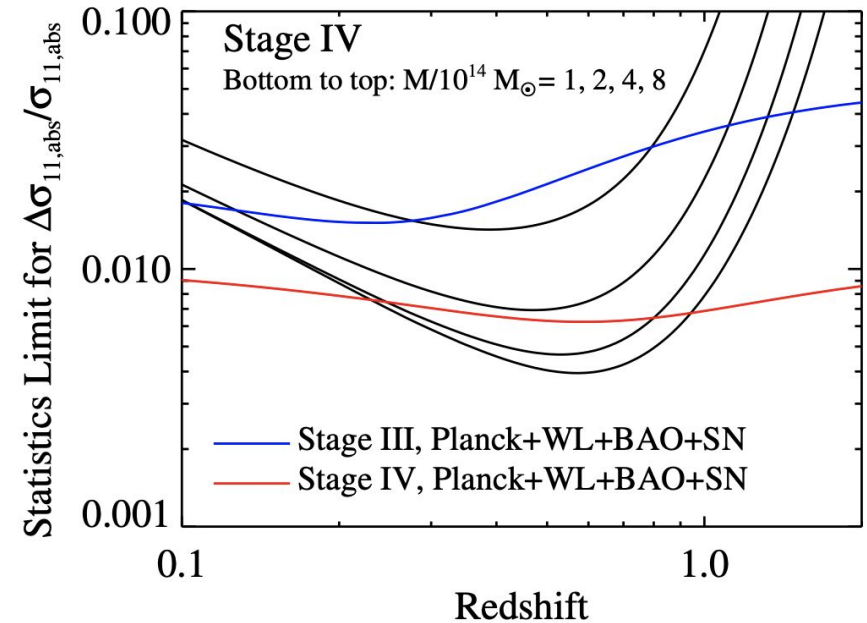
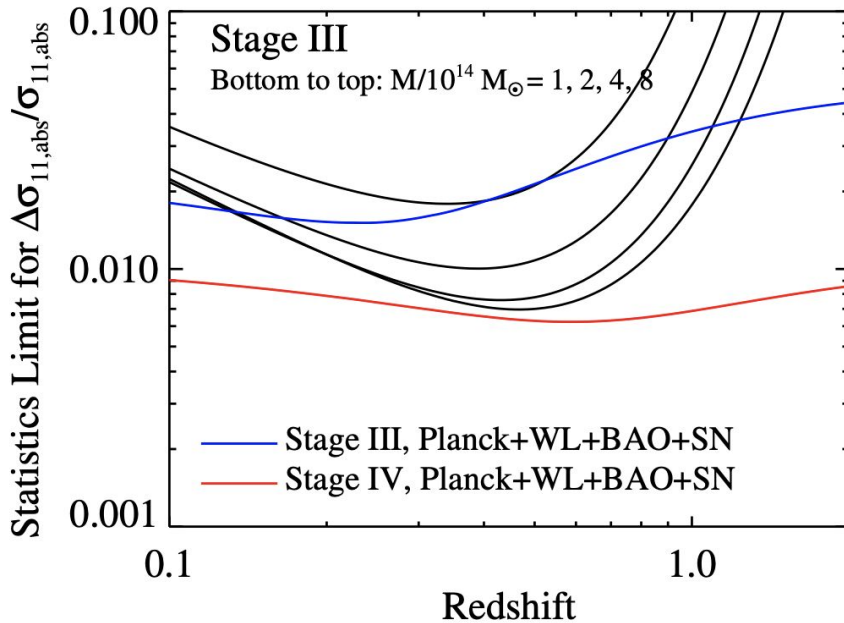
X-ray: NASA/CXC/CfA/ [M. Markevitch et al.](#);
Lensing Map: NASA/STScI; ESO WFI; Magellan/U.Arizona/ [D.Clowe et al.](#)
Optical: NASA/STScI; Magellan/U.Arizona/D.Clowe et al.

Long history of helping us prove important things...

Galaxy Clusters as Cosmological Probes

- **Clusters make great cosmological probes!**
- **Sensitive to background cosmology**
 - Background evolution controls the evolution of the volume element
 - Impacts both the current number density as well as the relative evolution of number density over cosmic history
 - In Λ CDM, controlled by the matter density parameter Ω_m
- **Sensitive to perturbations**
 - σ_8 : variance (“clumpiness”) of density perturbations
 - Clusters form from the highest density peaks in the initial density field
 - Higher $\sigma_8 \rightarrow$ more high-density peaks \rightarrow more clusters

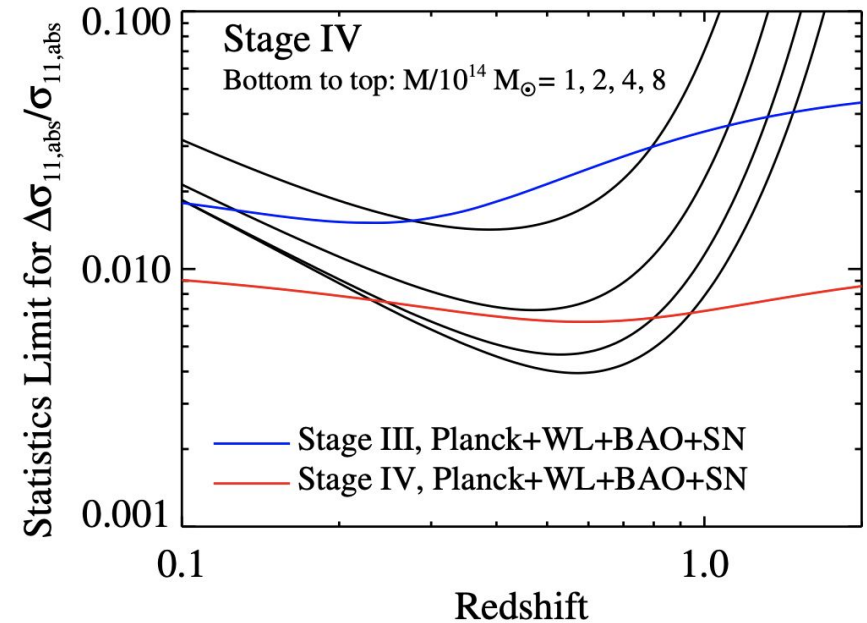
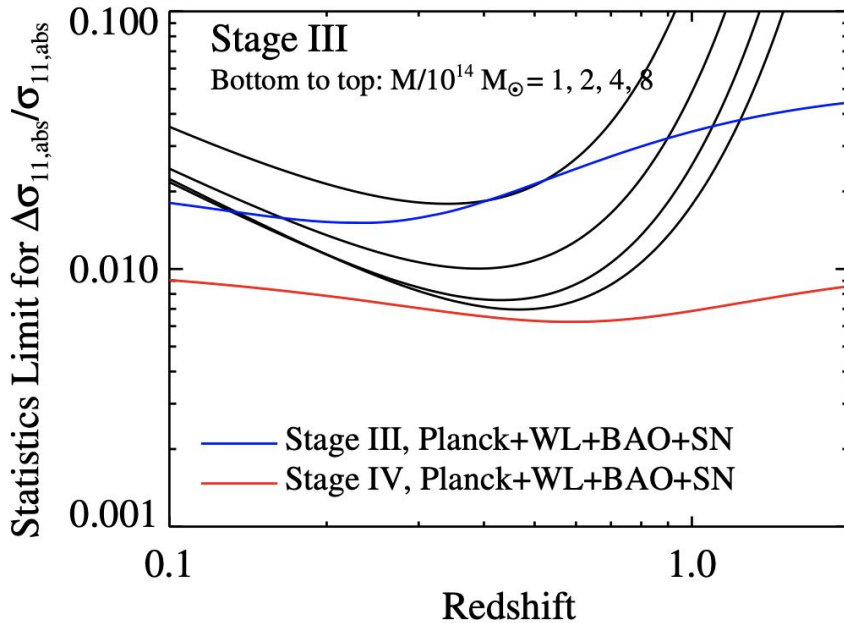
The “Promise”



Snowmass '13, Huterer et al.

“ We see that galaxy clusters are statistically competitive with and often better than probes

The “Promise”



Snowmass '13, Huterer et al.

“ We see that galaxy clusters are statistically competitive with and often better than probes

[...] the cosmological utility of cluster samples is always limited by our ability to estimate the corresponding cluster masses.”

Optical Clusters

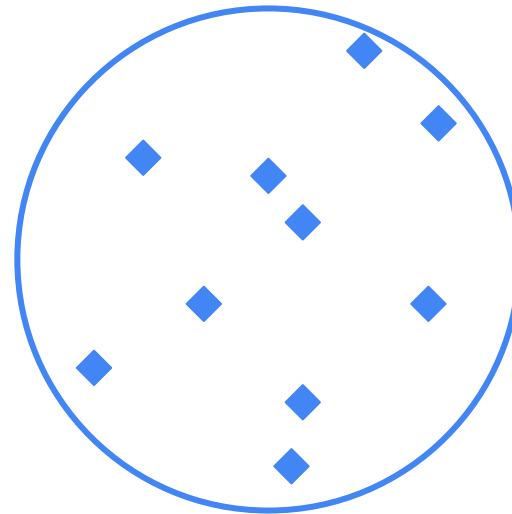
- **Operates based on photometric galaxy surveys**
- **Upsides**
 - Relatively easy to identify uniformly and completely
 - Relatively easy to obtain large sample sizes
 - Self-consistent mass calibration becomes possible via lensing masses
- **Downsides**
 - Photometry (and photometric redshifts) is inherently noisy; much of the line-of-sight information is lost
 - Results are highly dependent on the cluster finder algorithm

Projection Effects

- The line-of-sight issue

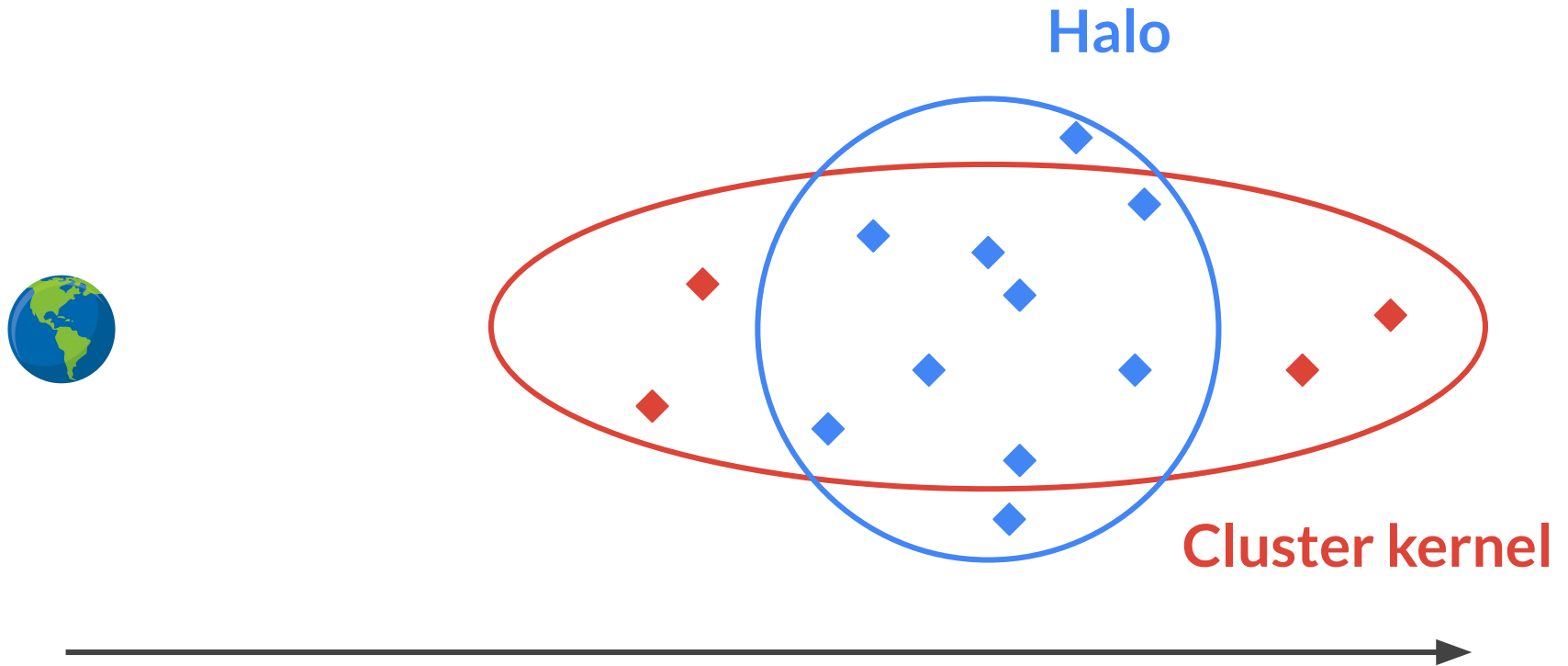


Halo



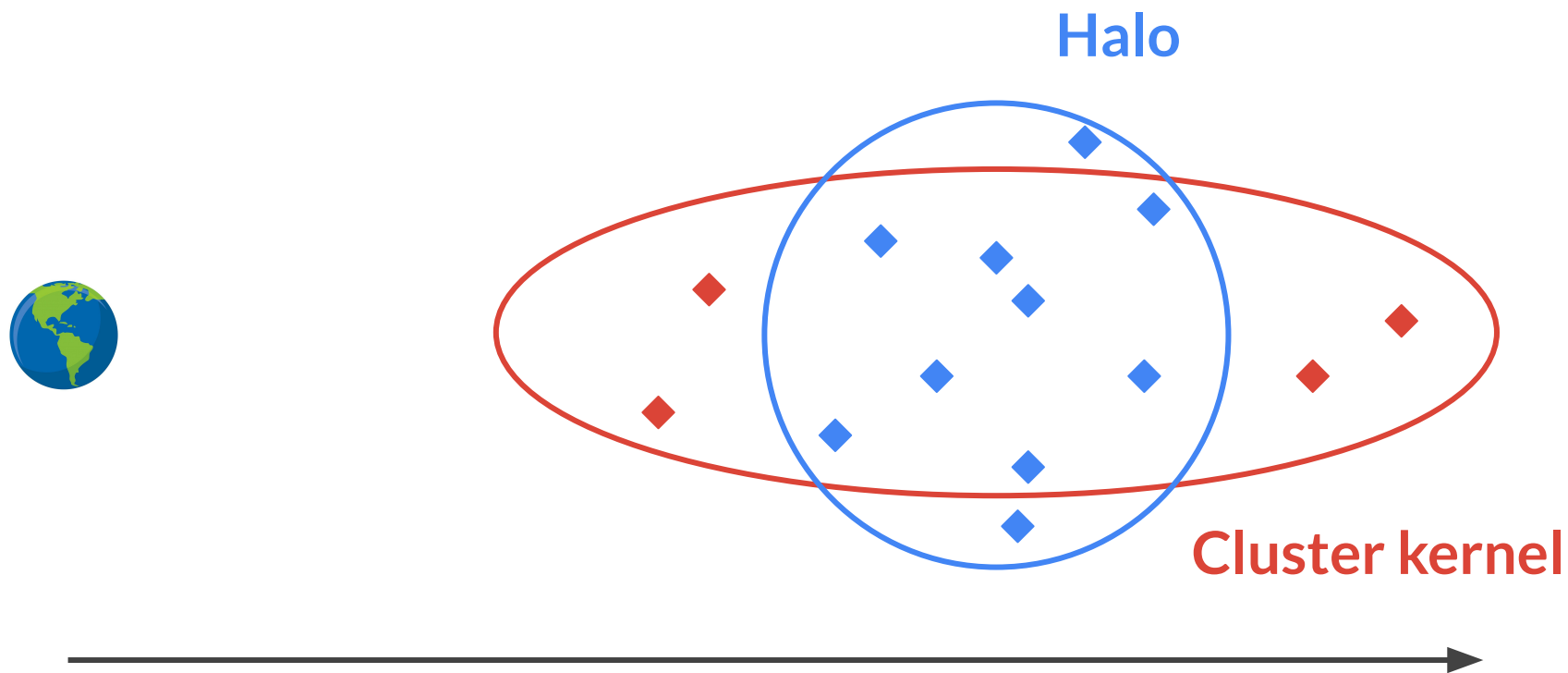
Projection Effects

- The line-of-sight issue



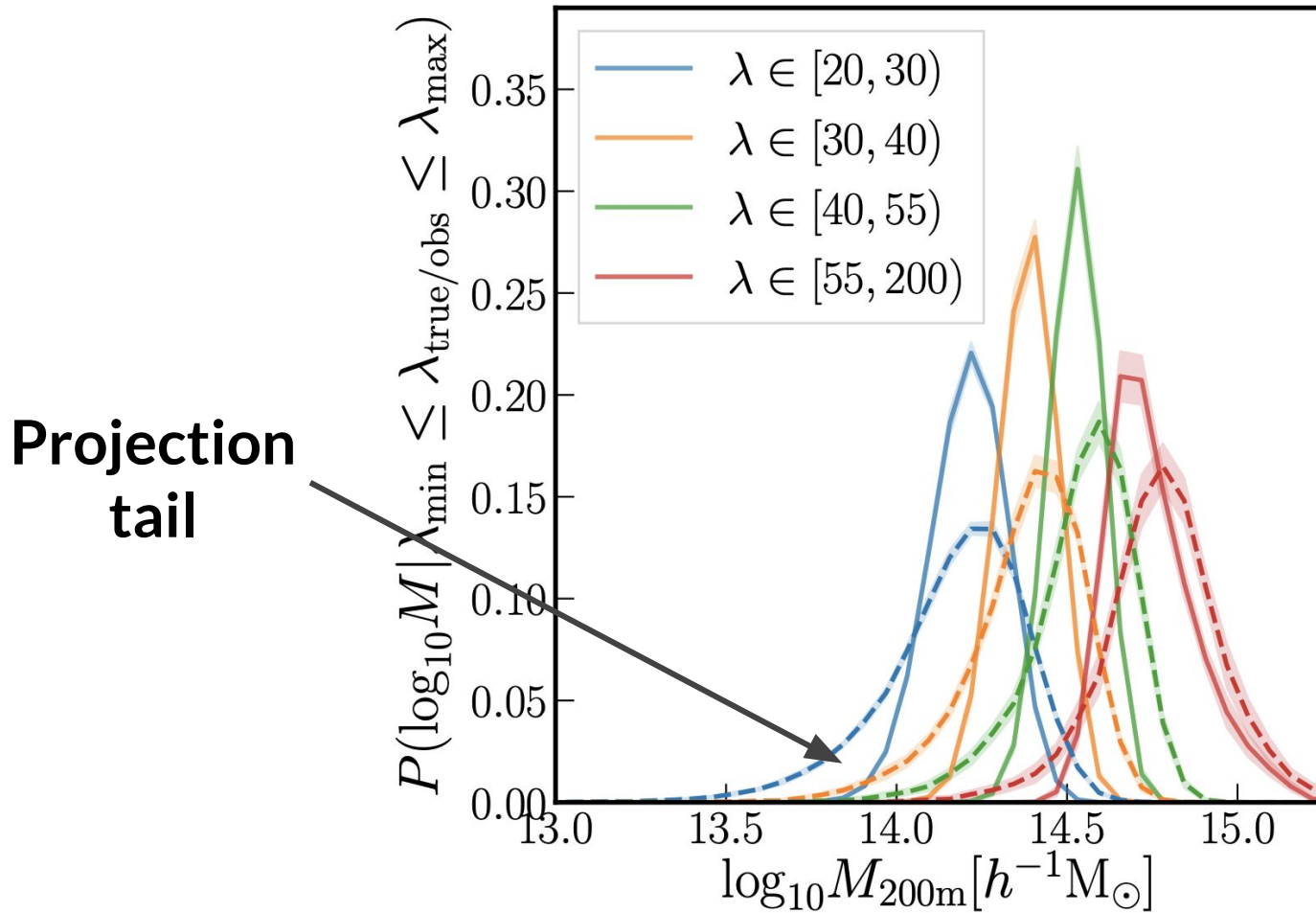
Projection Effects

- The line-of-sight issue

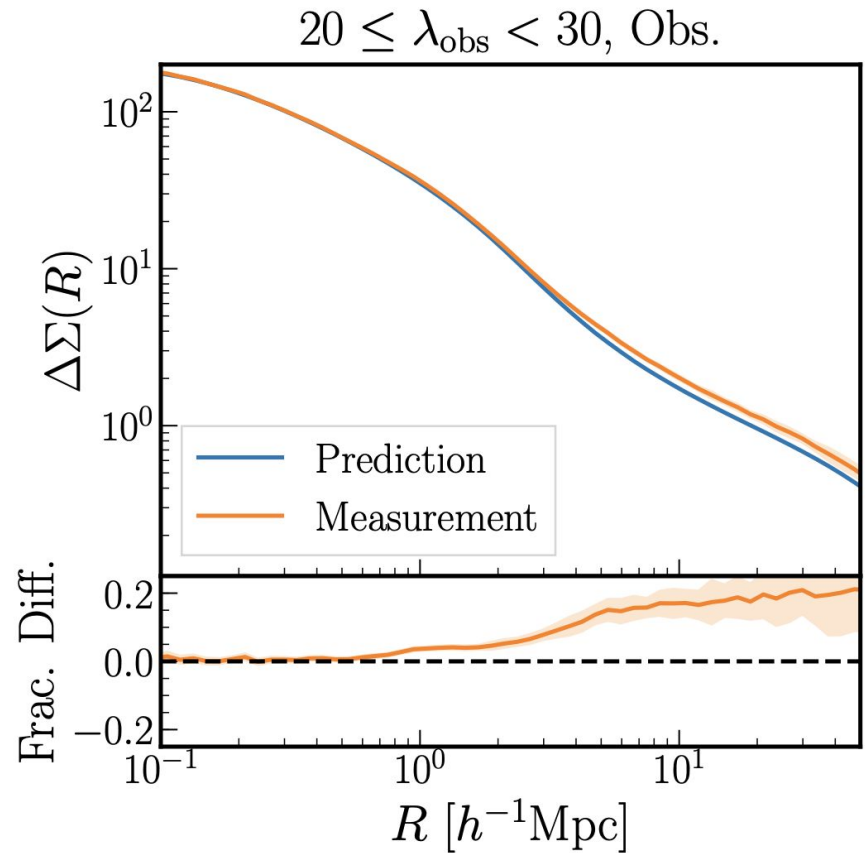
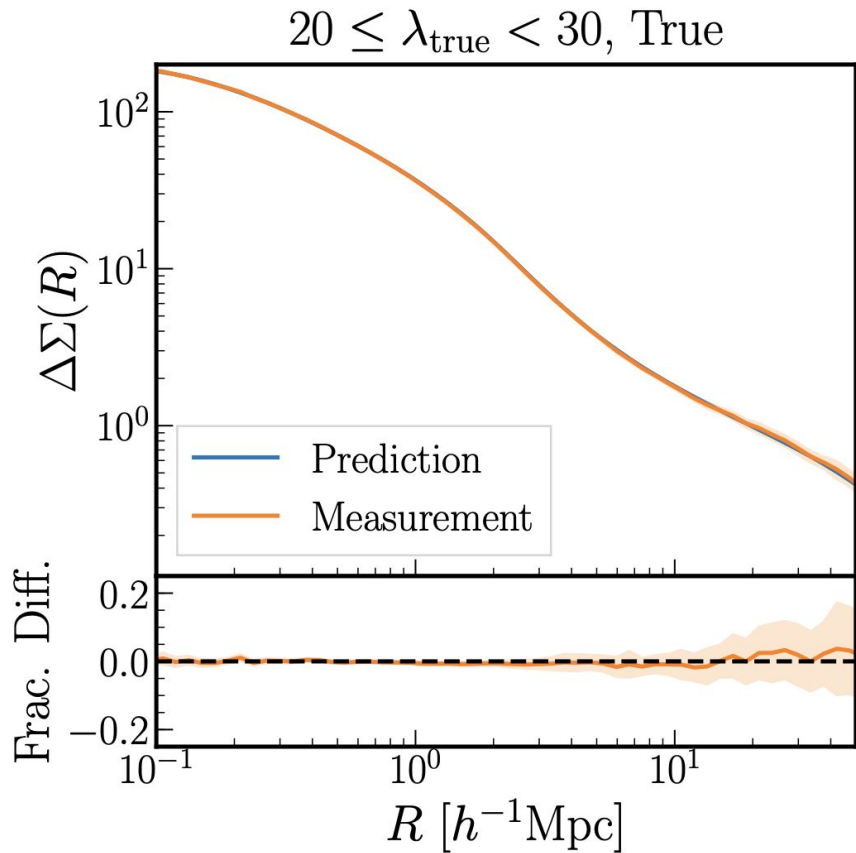


Interlopers contaminate the **true richness**

Projection Effects: Impact on Richnesses

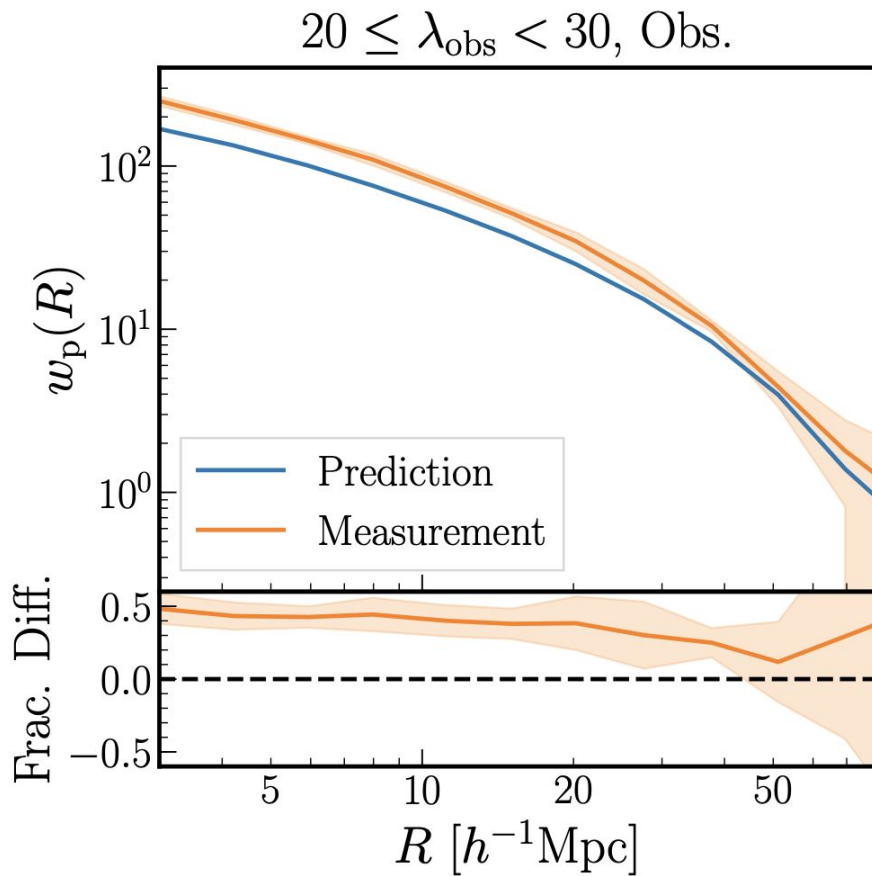
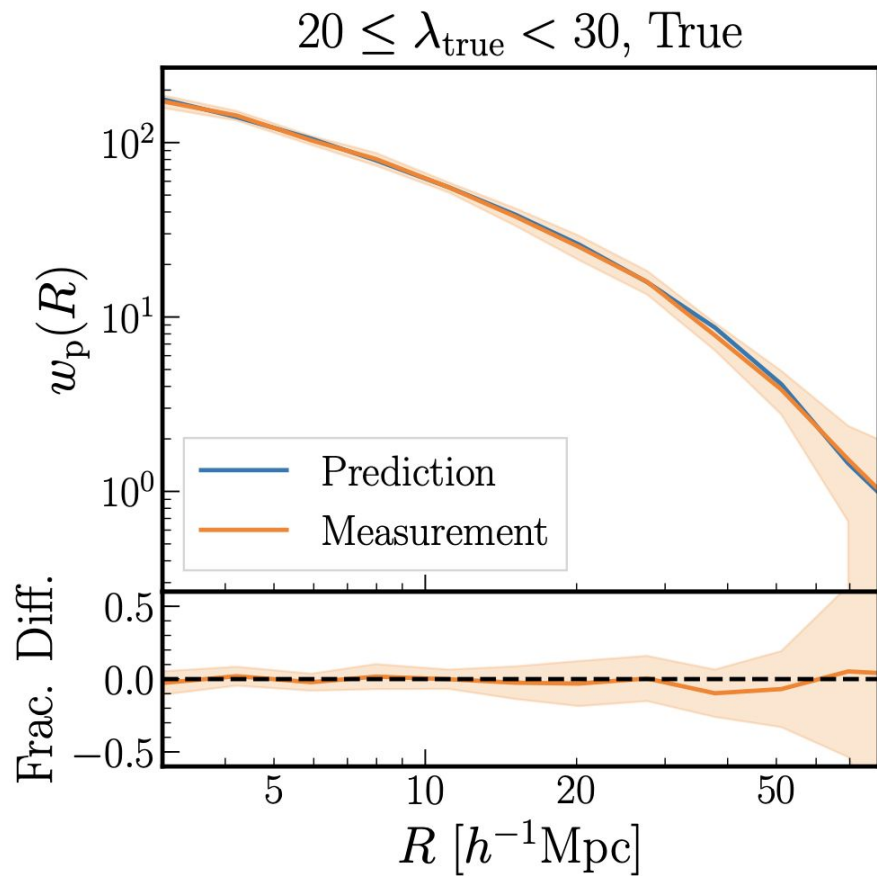


Unexpected Large-Scale Boosts



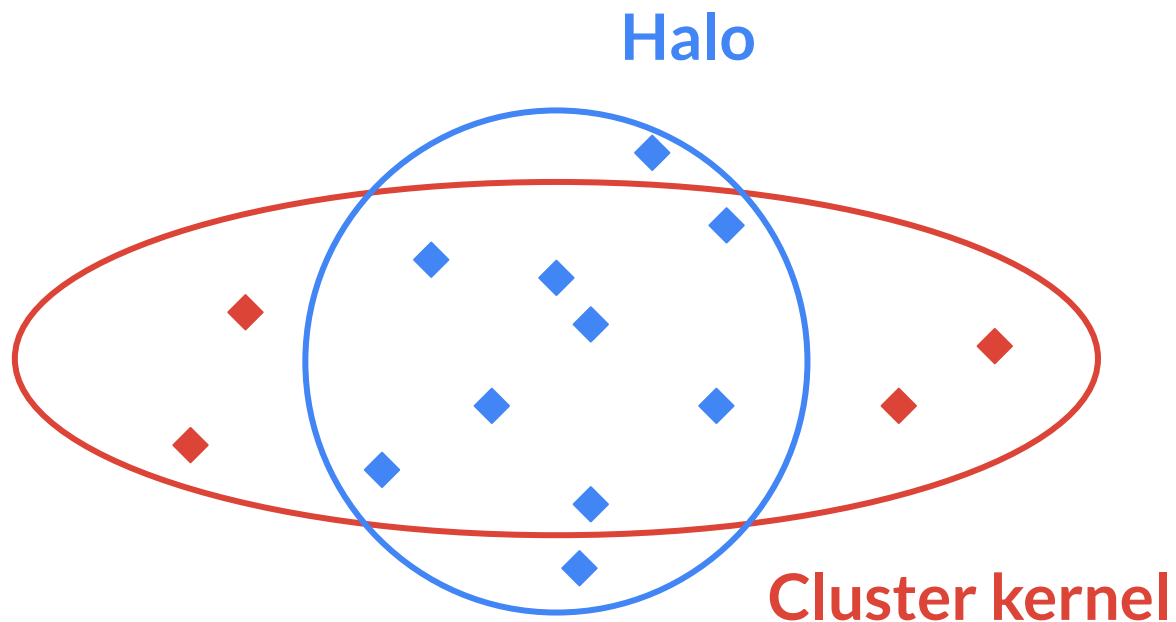
Observed clusters show a clear large-scale boost in lensing!

Unexpected Large-Scale Boosts

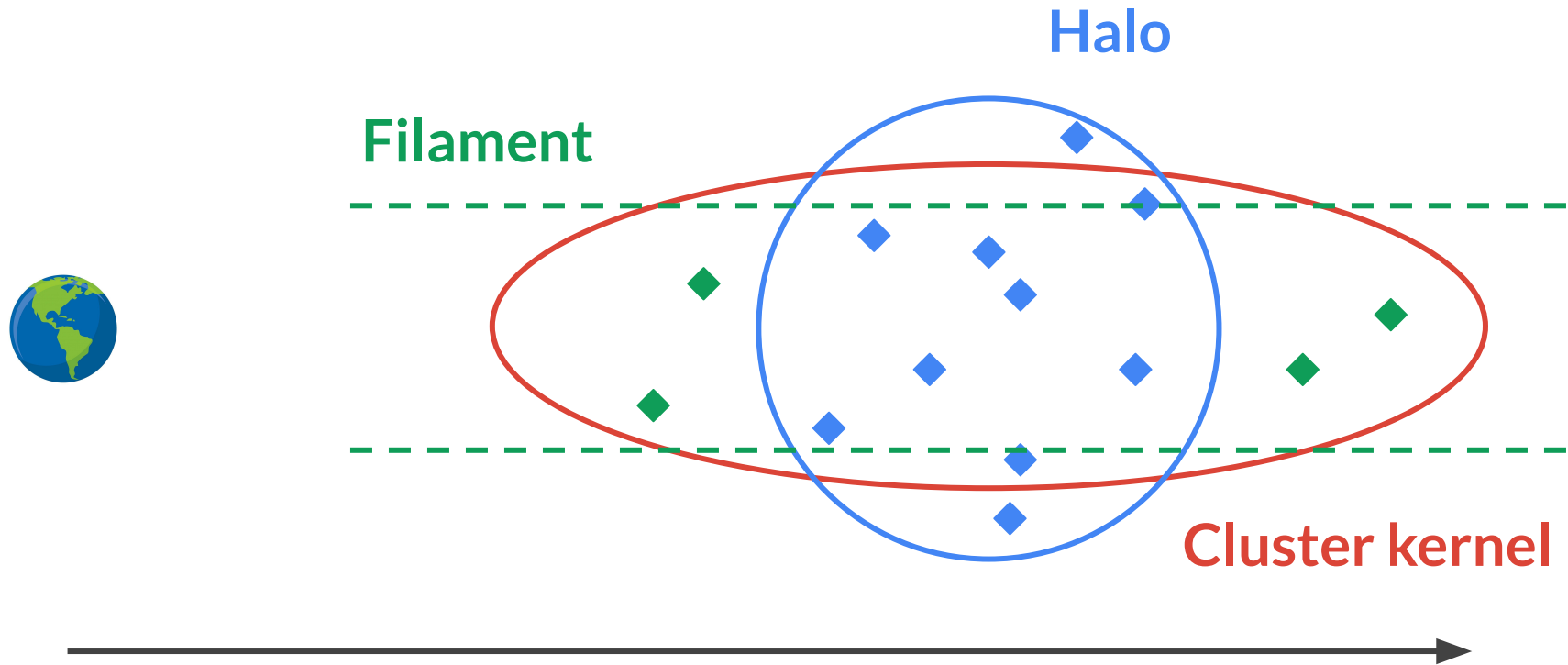


And consistent boosts are also found in clustering!

Interpreting Projection Effects



Interpreting Projection Effects



Cluster kernels naturally prefer **aligned filaments** that modify lensing/clustering signals

Now to Cosmology

- **Cluster Cosmology Observables**

- Cluster abundances
- Cluster lensing
- Cluster clustering

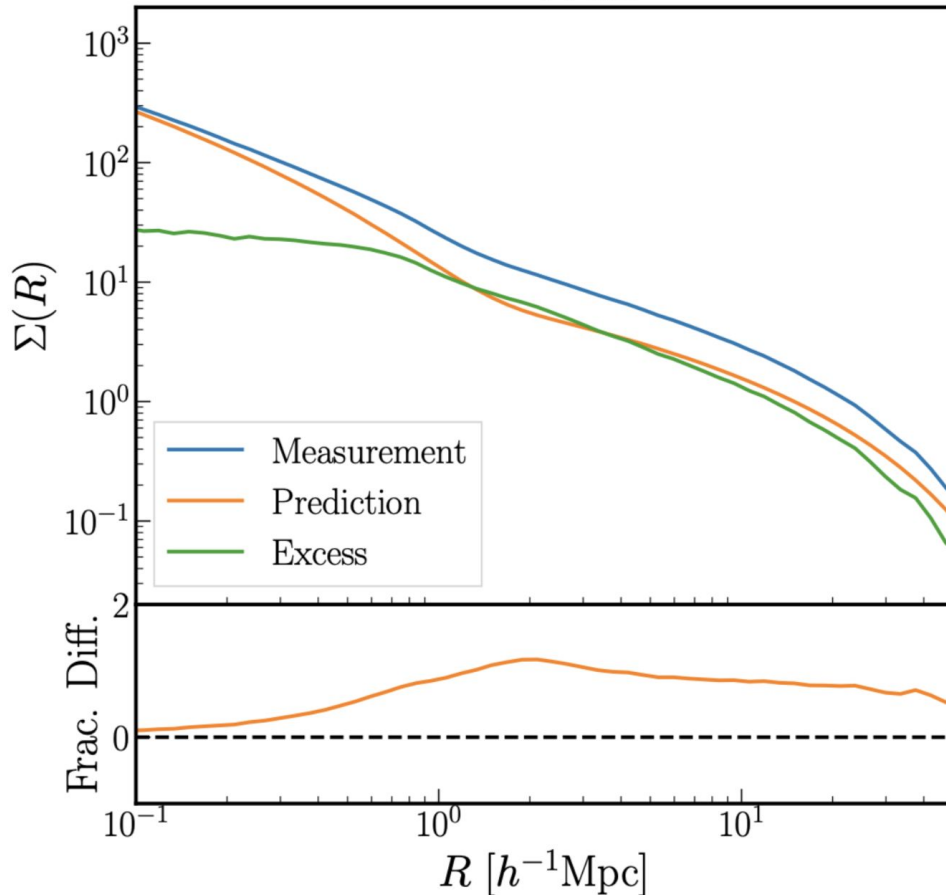
- **Modeling Ingredients**

- Halo model predictions from the `dark emulator`
- Mass-Observable Relation
- Systematic effects (photo-z, boost factors, miscentering, ...)
- *Projection effects*

- **Forward-model all observables for multiple richness bins**

Modeling Projection Effects for Cosmology

$20 < \lambda < 30, f_{\text{true}} < 0.75$



**Model the excess mass
as a multiplicative factor**

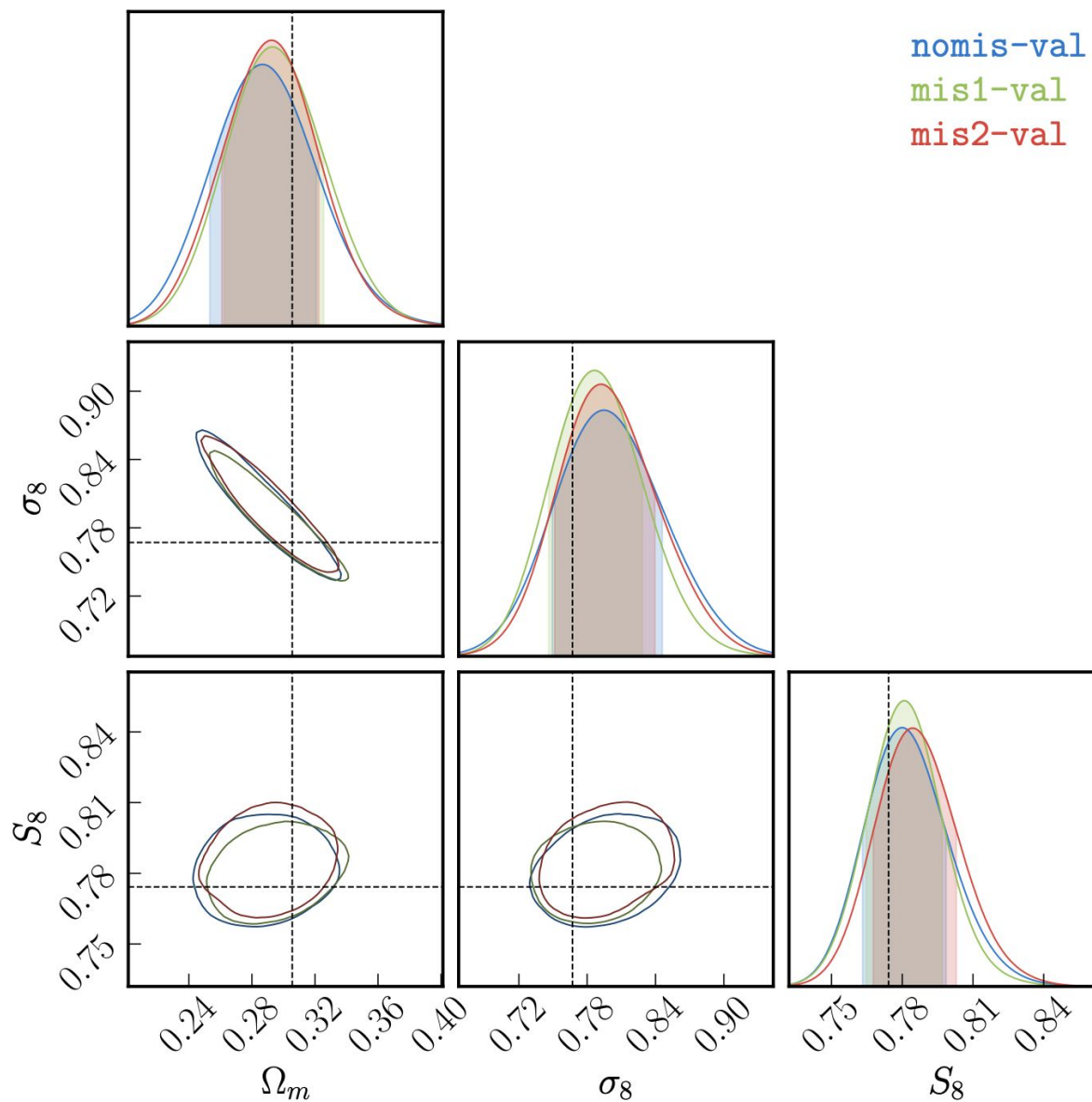
$$A(R) = \begin{cases} A_0(R/R_0) & \text{for } R \leq R_0, \\ A_0 - c \ln(R/R_0) & \text{for } R > R_0. \end{cases}$$

**And treat it as
effective biases**

$$\Sigma^{\text{proj}}(R) = A(R)\Sigma^{\text{iso}}(R),$$

$$w_p^{\text{proj}}(R) = A^2(R)w_p^{\text{iso}}(R).$$

Validating the Model



Application to SDSS RM

- **Data Set**

- Based on the Sloan Digital Sky Survey (SDSS) DR8 photometry
- Covers $\sim 10,000 \text{ deg}^2$ with $\sim 8,000$ RM clusters
- Additionally ~ 39 million background galaxy shapes

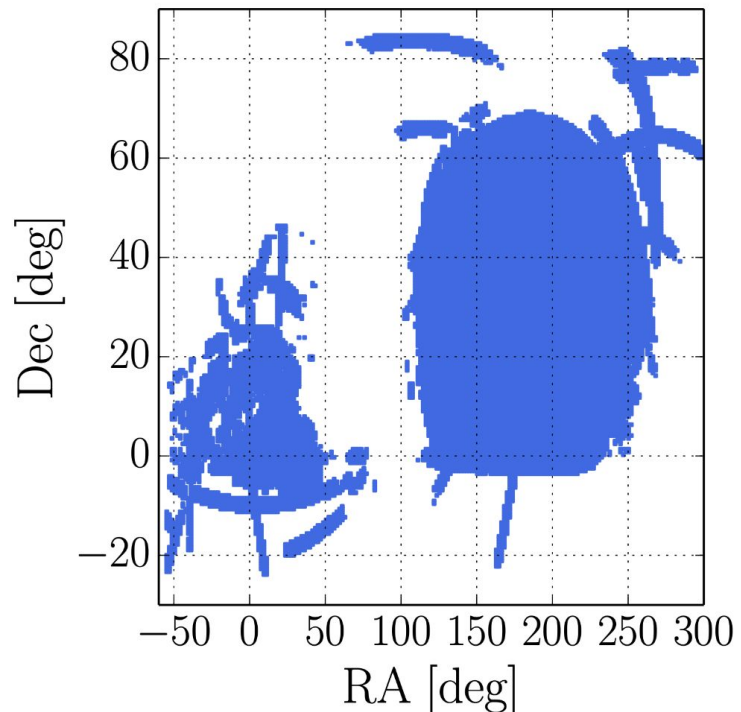
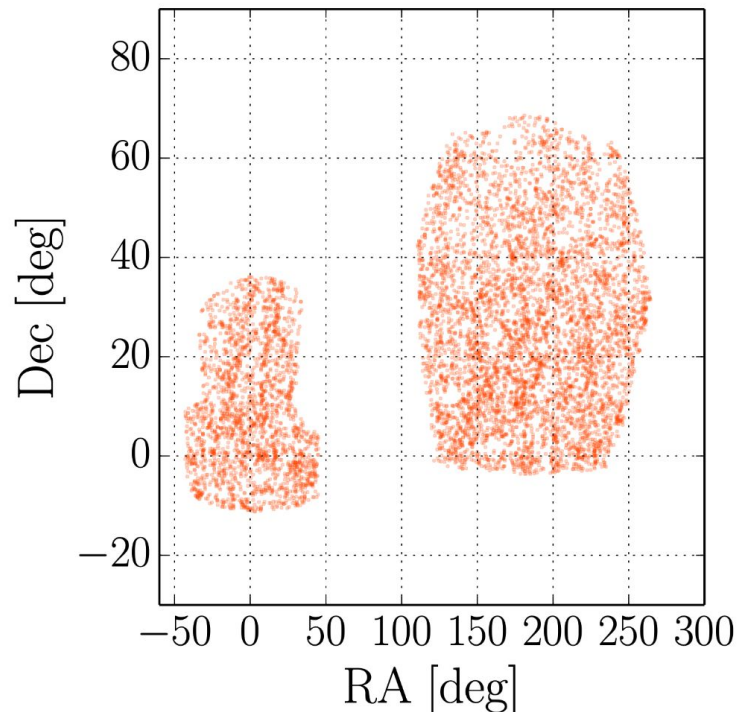
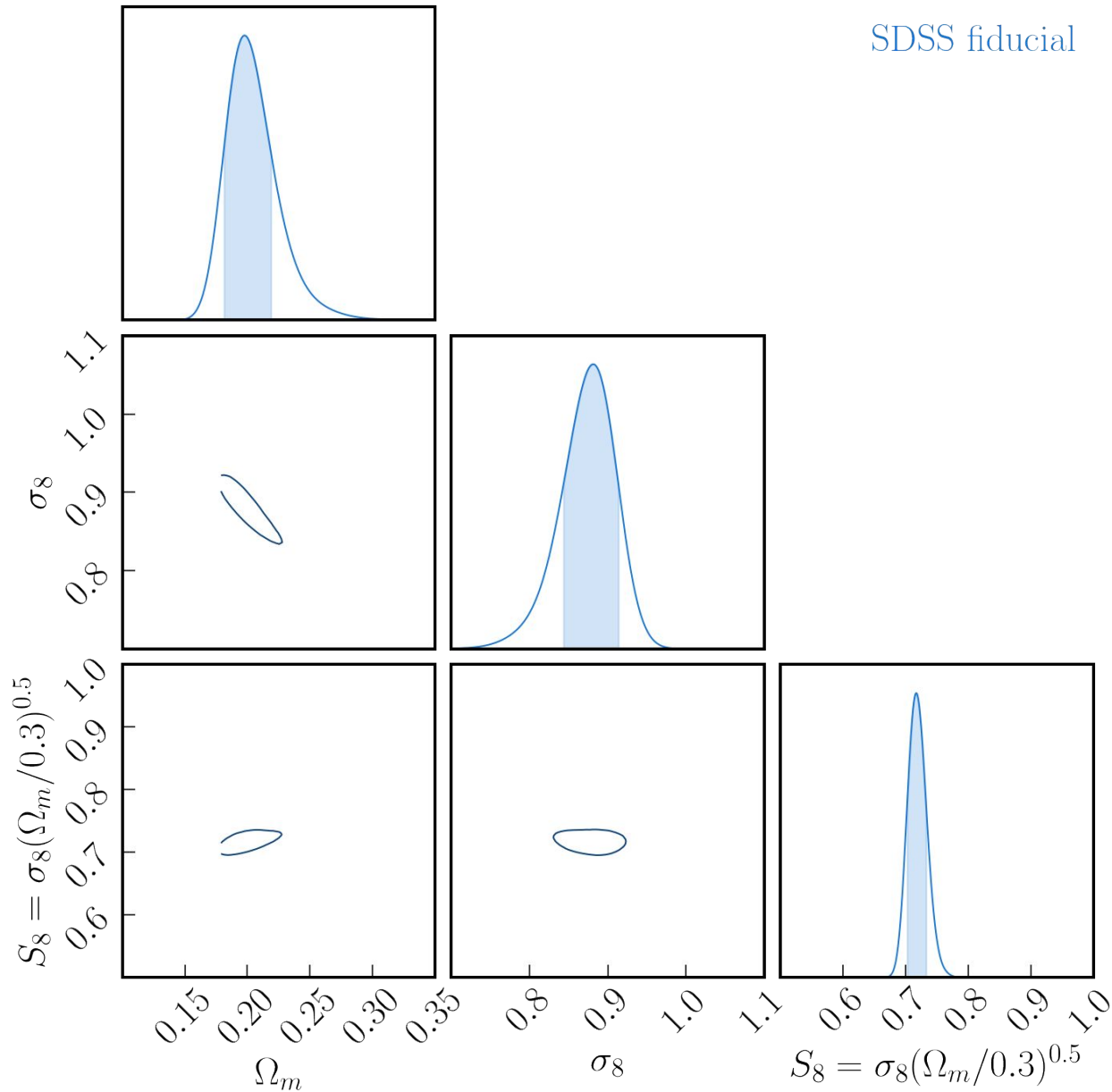
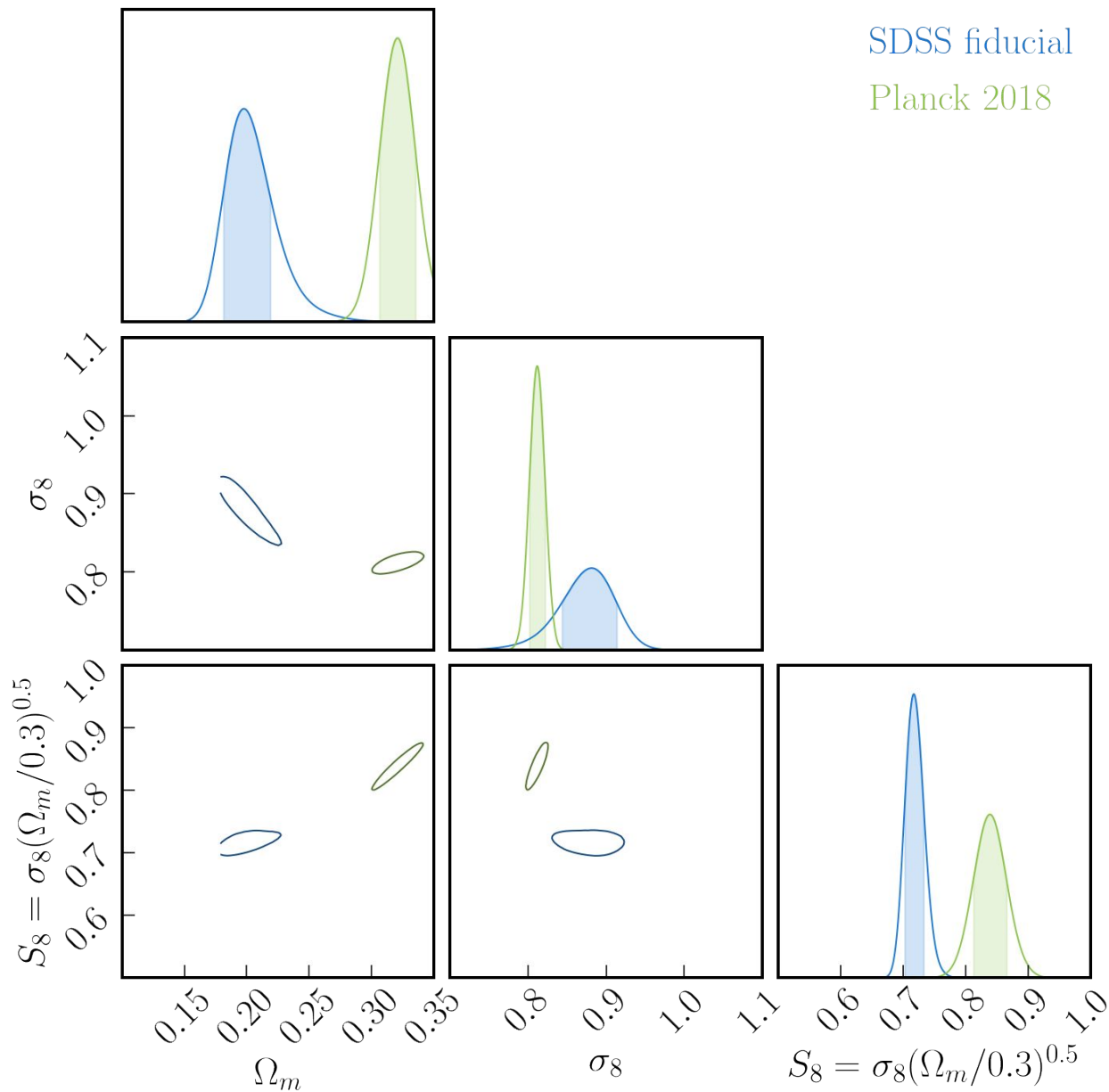


Figure from Murata et al.
(2017)

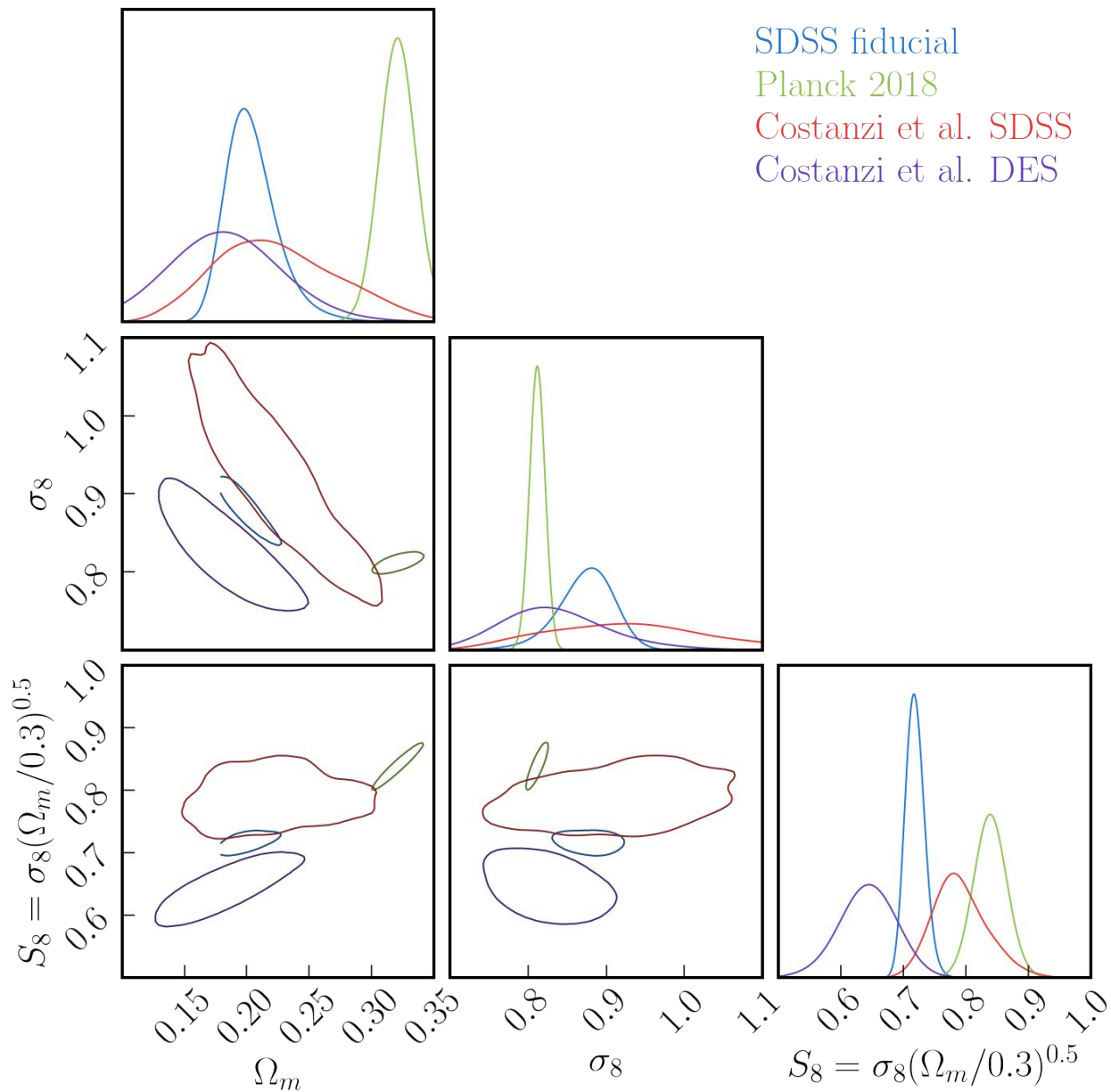
Fiducial Results from SDSS RM



Fiducial Results from SDSS RM



Fiducial Results from SDSS RM



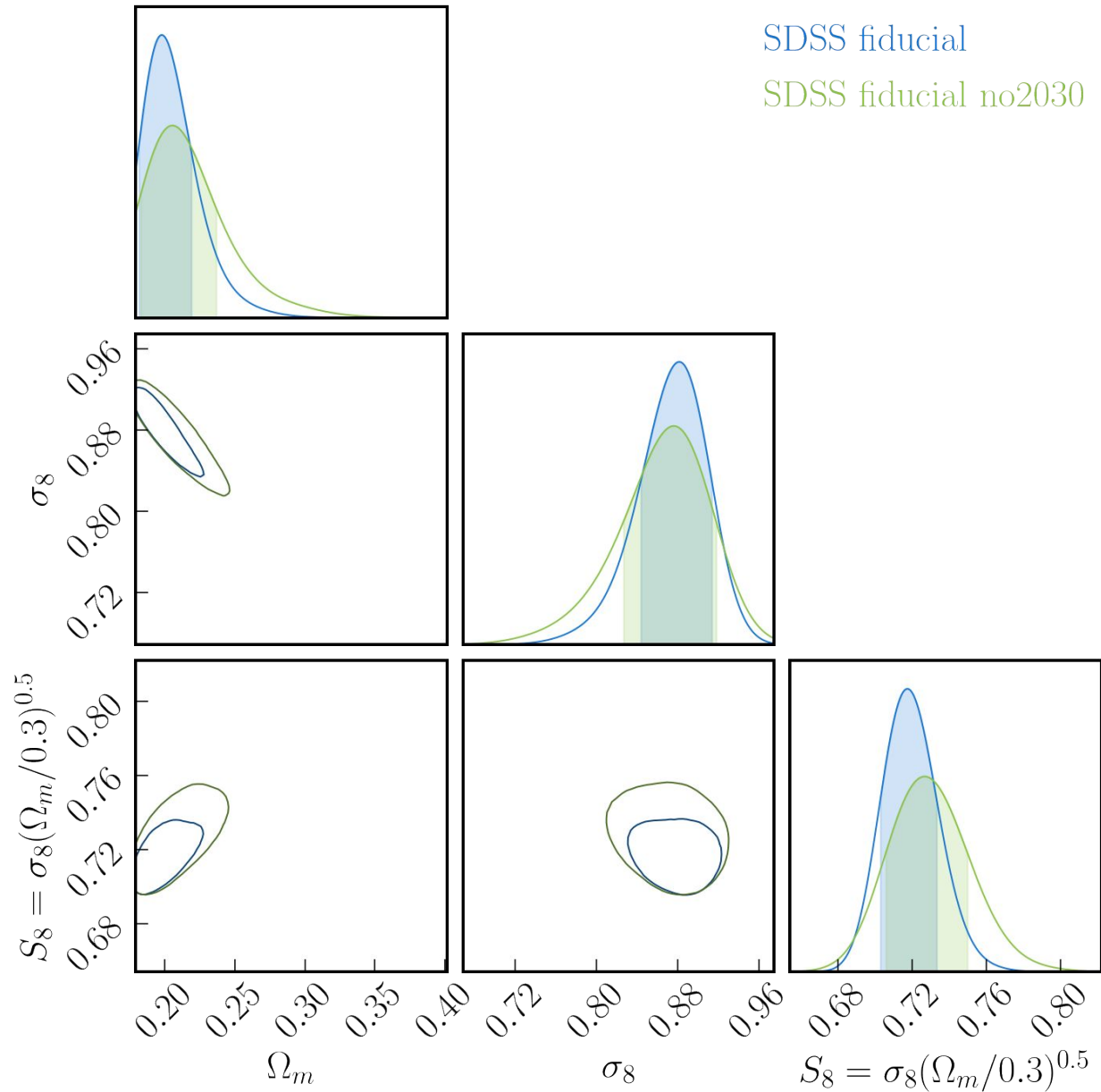
Beware!

A Posteriori Results Beyond This Point

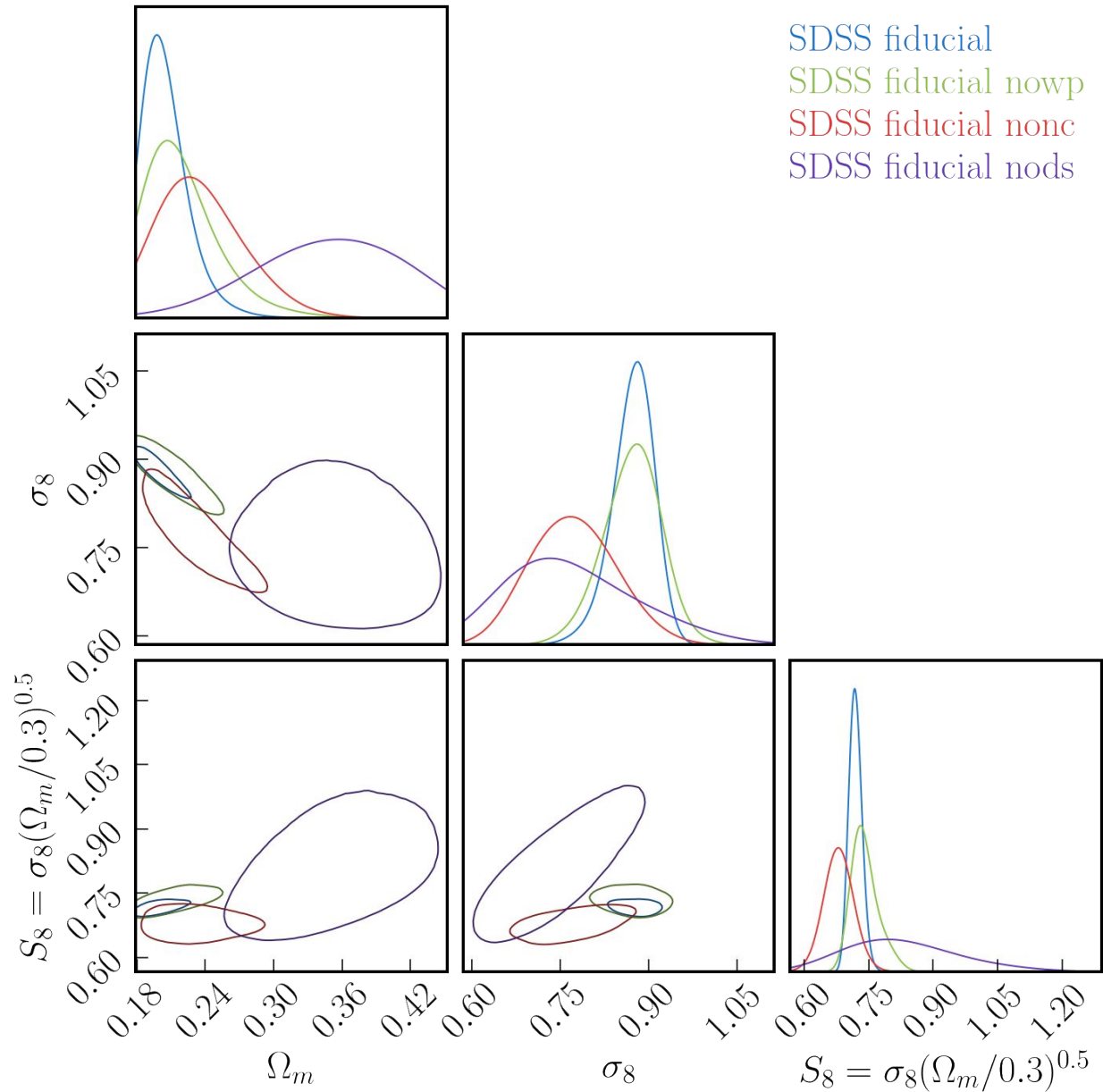
Confirmation Bias Sightings Reported

You Have Been Warned

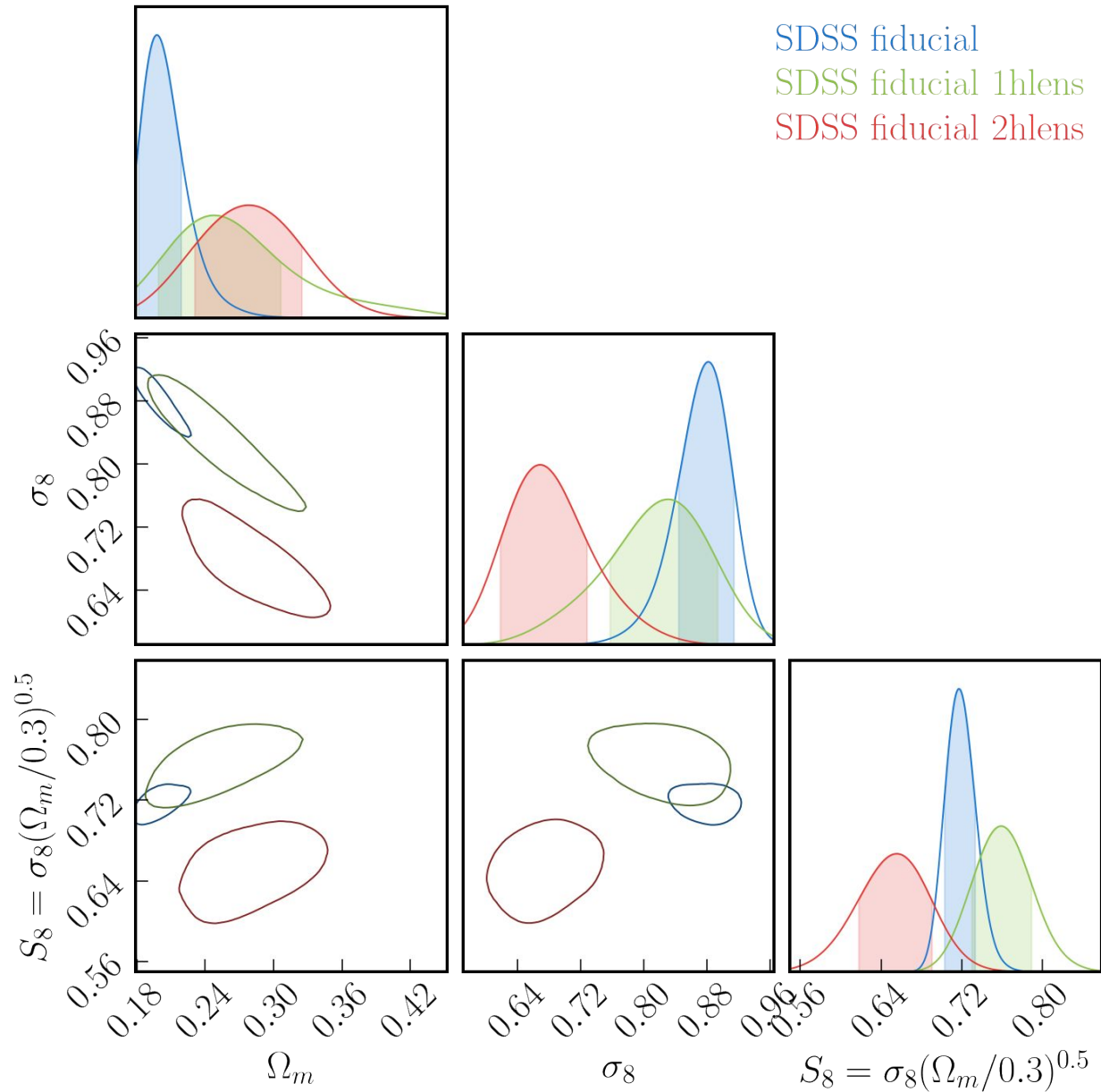
Post-Unblinding Tests



Post-Unblinding Tests



Post-Unblinding Tests



So, What Now?

- **From simulations to real data**

- Pipeline was fine on the validation challenge, but on real data shows confusing results
- Several important differences between simulations and real data
 - Assumed vs. real galaxy-halo connection
 - Lensing via true matter distributions vs. via galaxy shapes
 - Mismodeling in known observational systematics
 - **New physics?!**

- **Coincidences (?)**

- Both our results and results from DES are in consistent disagreement against “standard” cosmology results, e.g., Planck
- If more than a coincidence, this points at problems affecting optical clusters across different data sets and analyses

So, then What Next?

- **Near term**

- Follow-up studies on the cosmology results
- First HSC-SSP cluster cosmology
- DES Y3 cluster cosmology

- **Longer term**

- Multi-wavelength cluster cosmology: optical + microwave + X-ray
- Enabled by upcoming cosmological surveys
 - Rubin LSST / PFS / DESI / Roman
 - Simons Observatory / CMB-S4
 - eROSITA
- Allows for *cross*-calibration, rather than *self*-calibration, of systematics